

# Normal Forms + DPLL

CSE 507  
September 30, 2014



# ZACH






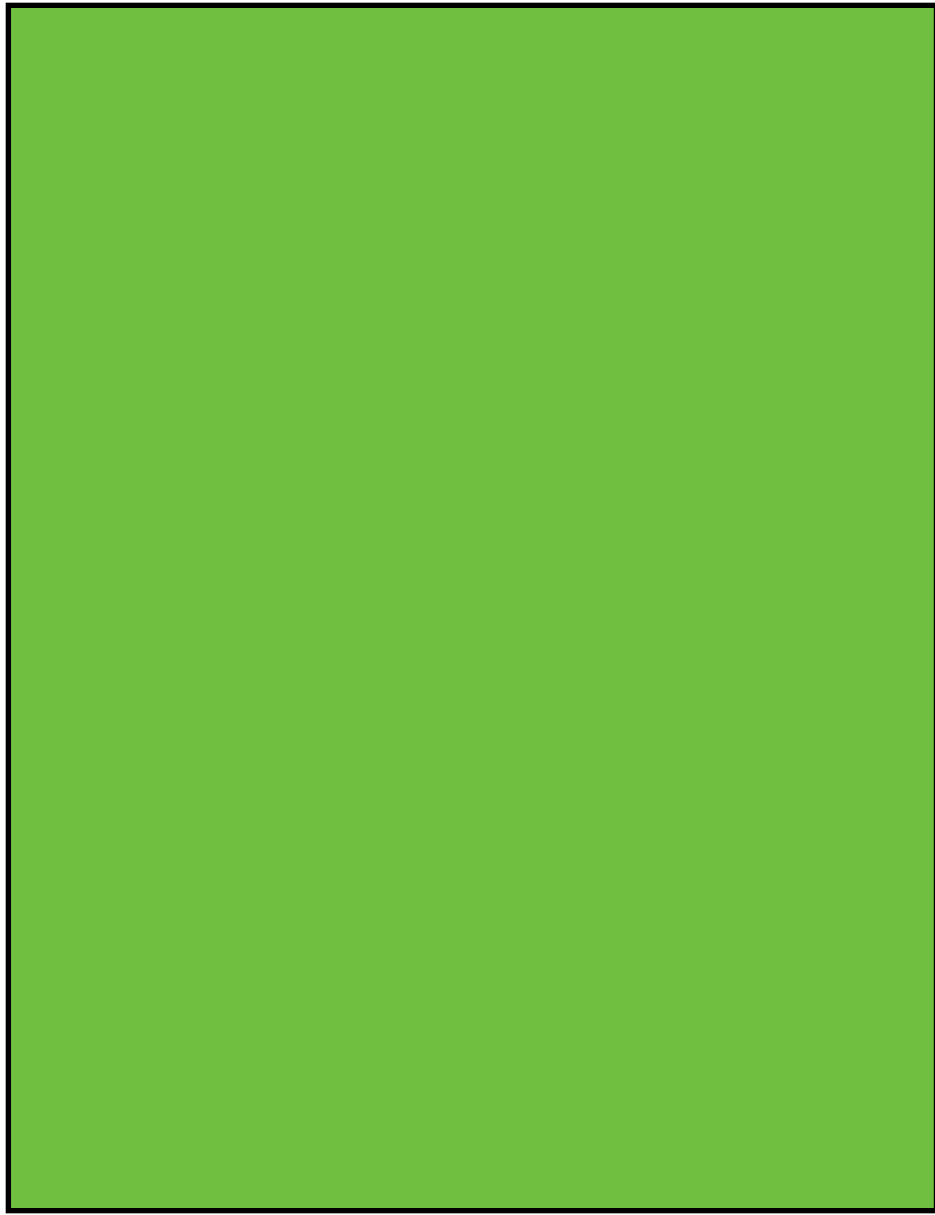
**DANGER**

**UNEXPLAINED  
NOTATION!  
ASK QUESTIONS!**

**notación inexplicable  
hacer preguntas**

LOS VIOLADORES  SERAN PROCESADOS







$A ::= \top \mid \perp \mid x$



Atoms

$A ::= \top \mid \perp \mid x$



$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$



$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

Literals



$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$

—  
—  
—  
—

$! F$

$F \wedge F$

$F \vee F$

$F \rightarrow F$

$F \leftrightarrow F$

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$

—  $! F$

—  $F \wedge F$

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Formulas



$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$

—  
—  
—  
—

$! F$

$F \wedge F$

$F \vee F$

$F \rightarrow F$

$F \leftrightarrow F$

$A$	$::=$	$\top$	$ $	$\perp$	$ $	$x$
$L$	$::=$	$A$	$ $	$\sim$	$ $	$A$
$F$	$::=$	$L$	$ $	$!$	$F$	
	$ $	$F$	$\wedge$	$F$	$ $	$F$
	$ $	$F$	$\vee$	$F$	$ $	$F$
	$ $	$F$	$\rightarrow$	$F$	$ $	$F$
	$ $	$F$	$\leftrightarrow$	$F$	$ $	$F$

A formula is satisfiable if there exists a function  $I$  from its variables to truth values such that, when we replace each variable  $x$  with  $I(x)$ , the formula evaluates to true.



$A$	$::=$	$\top$	$ $	$\perp$	$ $	$x$
$L$	$::=$	$A$	$ $	$\sim$	$ $	$A$
$F$	$::=$	$L$	$ $	$!$	$F$	
	$ $	$F$	$\wedge$	$ $	$F$	
	$ $	$F$	$\vee$	$ $	$F$	
	$ $	$F$	$\rightarrow$	$ $	$F$	
	$ $	$F$	$\leftrightarrow$	$ $	$F$	

A formula is satisfiable if there exists a function  $I$  from its variables to truth values such that, when we replace each variable  $x$  with  $I(x)$ , the formula evaluates to true.

A formula is valid if for every function  $I$  from its variables to truth values, when we replace each variable  $x$  with  $I(x)$ , the formula evaluates to true.

$A$	$::=$	$\top$	$ $	$\perp$	$ $	$x$
$L$	$::=$	$A$	$ $	$\sim$	$ $	$A$
$F$	$::=$	$L$	$ $	$!$	$F$	
	$ $	$F$	$\wedge$	$F$	$ $	$F$
	$ $	$F$	$\vee$	$F$	$ $	$F$
	$ $	$F$	$\rightarrow$	$F$	$ $	$F$
	$ $	$F$	$\leftrightarrow$	$F$	$ $	$F$

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Formula  $f$  is valid **iff**  $!f$  is



$A$	$::=$	$\top$	$ $	$\perp$	$ $	$x$
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	$ $	$F$	$\wedge$	$F$	$F$	
	$ $	$F$	$\vee$	$F$	$F$	
	$ $	$F$	$\rightarrow$	$F$	$F$	
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A formula is satisfiable if there exists a function  $I$  from its variables to truth values such that, when we replace each variable  $x$  with  $I(x)$ , the formula evaluates to true.

A formula is valid if for every function  $I$  from its variables to truth values, when we replace each variable  $x$  with  $I(x)$ , the formula evaluates to true.

Formula  $f$  is valid **iff**  $!f$  is

We can try to determine validity by search (enumerating assignments  $I$ ) or by

# Sat Solver



# Sat Solver

sat f =

...

# Sat Solver

define function sat that  
takes formula  $f$  as an

sat  $f$  =

...

# Sat Solver

```
sat f =  
  case f of  
  | ...
```



# Sat Solver

```
sat f =  
  case f of  
  | ...
```



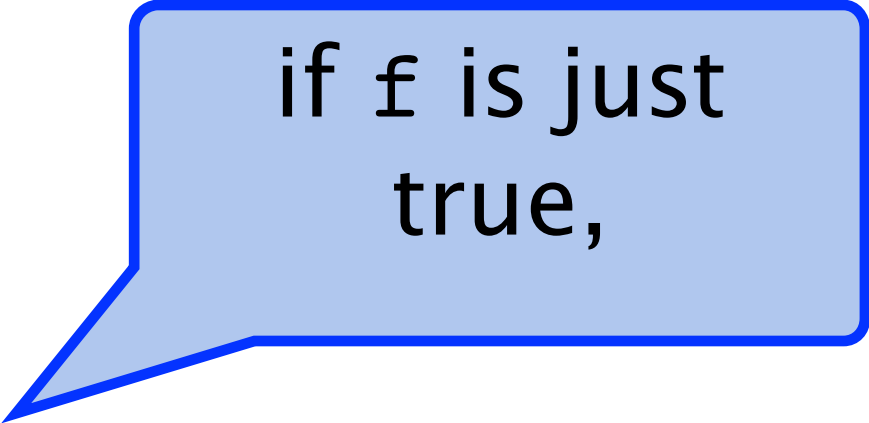
analyze structure of  $f$

# Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ...
```

# Sat Solver

```
sat f =  
  case f of  
  | T => SAT  
  | ...
```



if  $f$  is just  
true,

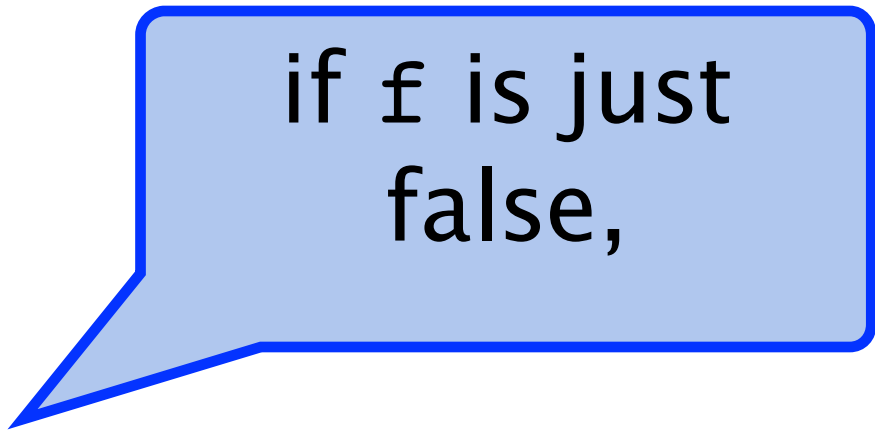
# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | ...
```



# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | ...
```



if  $\perp$  is just  
false,

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _    =>  
  ...
```

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
  ...
```



all other cases...

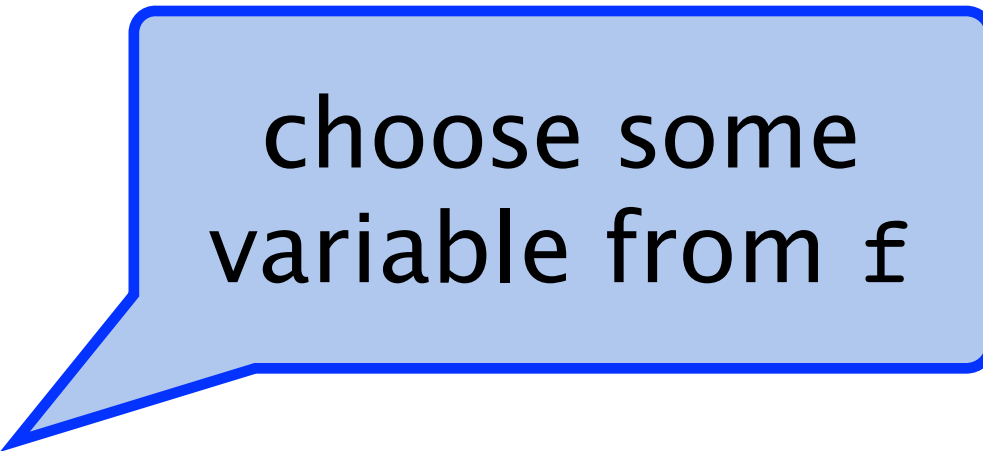
# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _    =>  
    x = pick_var f  
    ...
```



# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _    =>  
    x = pick_var f  
    ...
```



choose some  
variable from  $f$

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x  $\mapsto$   $\top$ ] = SAT then  
      ...
```

# Sat Solver

$f[x \mapsto \top]$

# Sat Solver

$f[x \mapsto T]$

replace  $x$  with  
 $T$  throughout  $f$



# Sat Solver

replace  $x$  with  $T$  throughout  $f$

$f[x \mapsto T]$

$$(x \wedge y \vee z \rightarrow y \vee x)[x \mapsto T] = (T \wedge y \vee z \rightarrow y \vee T)$$

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x  $\mapsto$   $\top$ ] = SAT then  
      ...
```

# Sat Solver

```
sat f =  
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  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x  $\mapsto$   $\top$ ] = SAT then  
      ...
```

if we find a satisfying assignment with x set to T

# Sat Solver

```
sat f =
  case f of
  |  $\top$  => SAT
  |  $\perp$  => UNSAT
  | _ =>
    x = pick_var f
    if sat f[x  $\mapsto$   $\top$ ] = SAT then
      SAT
    else
      ...
```

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
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  | _ =>  
    x = pick_var f  
    if sat f[x  $\mapsto$   $\top$ ] = SAT then  
      SAT  
    else  
      ...
```

then formula  $f$  is



# Sat Solver

```
sat f =
  case f of
  |  $\top$  => SAT
  |  $\perp$  => UNSAT
  | _ =>
    x = pick_var f
    if sat f[x  $\mapsto$   $\top$ ] = SAT then
      SAT
    else
      sat (f[x  $\mapsto$   $\perp$ ])
```

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat (f[x  $\mapsto$   $\top$ ]) == SAT then  
      SAT  
    else  
      sat (f[x  $\mapsto$   $\perp$ ])
```

try setting x to false ...

... and recurse

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x  $\mapsto$   $\top$ ] = SAT then  
      SAT  
    else  
      sat (f[x  $\mapsto$   $\perp$ ])
```

Correct?

# Sat Solver

```
sat f =
  case f of
  |  $\top$  => SAT
  |  $\perp$  => UNSAT
  | _ =>
    x = pick_var f
    if sat f[x  $\mapsto$   $\top$ ] = SAT then
      SAT
    else
      sat (f[x  $\mapsto$   $\perp$ ])
```

# Sat Solver

```
sat f =  
  case f of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f  
    if sat f[x  $\mapsto$   $\top$ ] = SAT then  
      SAT  
    else  
      sat (f[x  $\mapsto$   $\perp$ ])
```



# Today

## Normal Forms

- desugaring
- negation normal form (NNF)
- disjunctive normal form (DNF)
- conjunctive normal form (CNF)



# Today

## Normal Forms

- desugaring
- negation normal form (NNF)
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- conjunctive normal form (CNF)

## DPLL

- resolution
- binary constraint propagation
- a better sat solver

# Today

clean up

## Normal Forms

- desugaring
- negation normal form (NNF)
- disjunctive normal form (DNF)
- conjunctive normal form (CNF)

## DPLL

- resolution
- binary constraint propagation
- a better sat solver

# Today

clean up

## Normal Forms

- desugaring
- negation normal form (NNF)
- disjunctive normal form (DNF)
- conjunctive normal form (CNF)

## DPLL

combine search and

- resolution
- binary constraint propagation
- a better sat solver

$A ::= \top \mid \perp \mid x$

$L ::= A \mid \sim A$

$F ::= L$

—  
—  
—  
—

$! F$

$F \wedge F$

$F \vee F$

$F \rightarrow F$

$F \leftrightarrow F$

$F ::= L$   
|  $! F$   
|  $F / \backslash F$   
|  $F \backslash / F$   
|  $F -> F$   
|  $F <-> F$

$F ::= L$

-----

$! F$

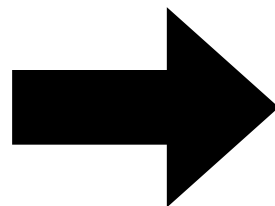
$F / \backslash F$

$F \backslash / F$

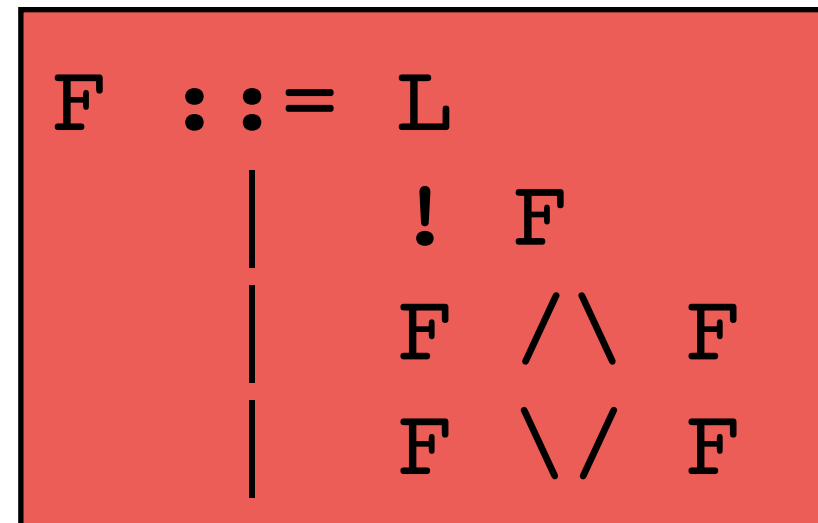
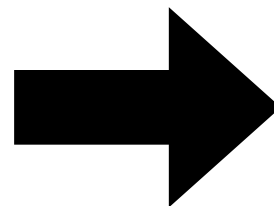
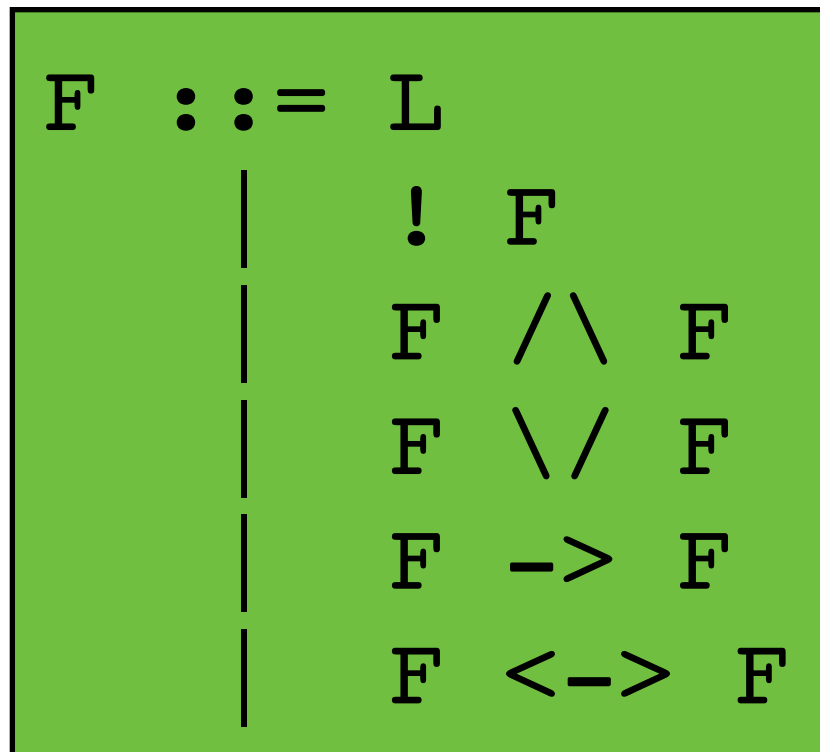
$F \rightarrow F$

$F \langle \rightarrow \rangle F$

$F ::= L$   
|  
 $F ! F$   
 $F / \backslash F$   
 $F \backslash / F$   
 $F -> F$   
 $F <-> F$



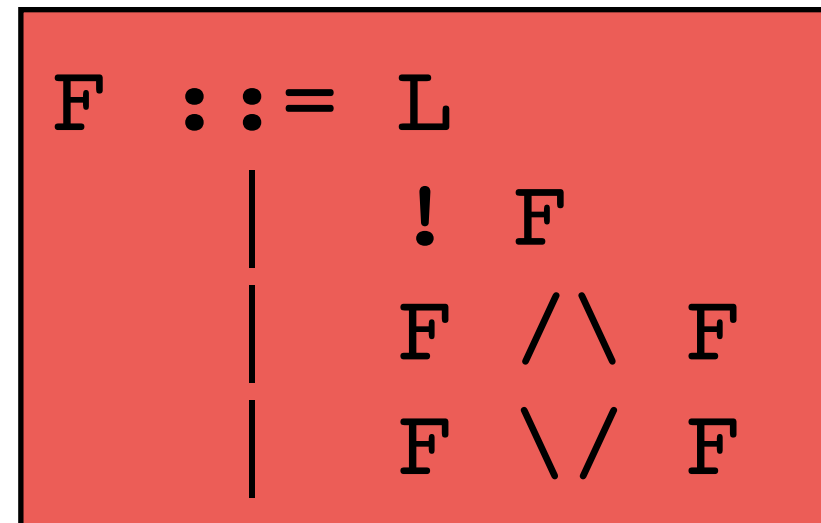
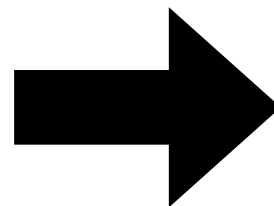
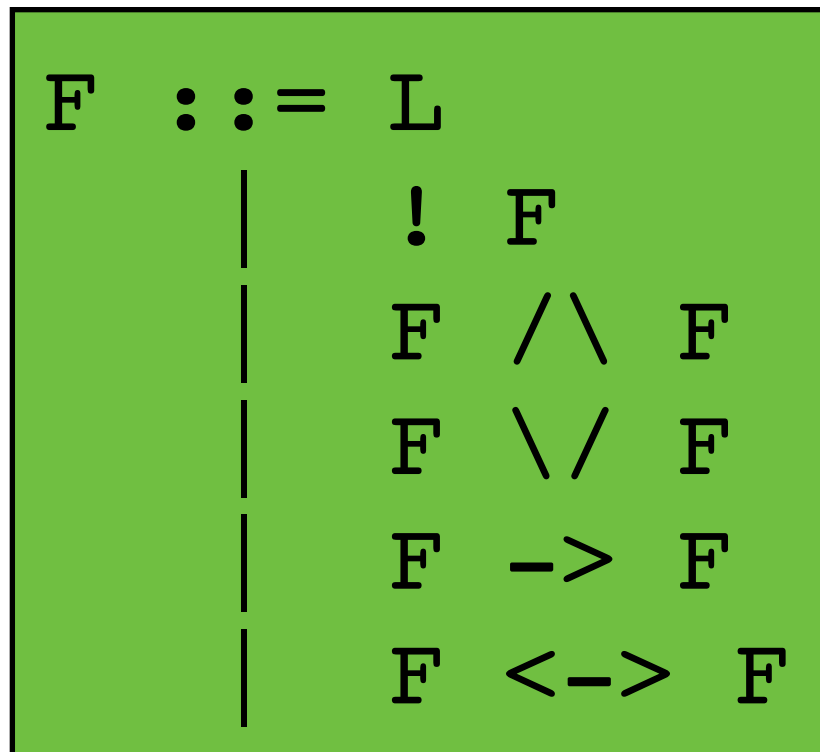
$F ::= L$   
|  
 $F ! F$   
 $F / \backslash F$   
 $F \backslash / F$




---

desugar  $f =$

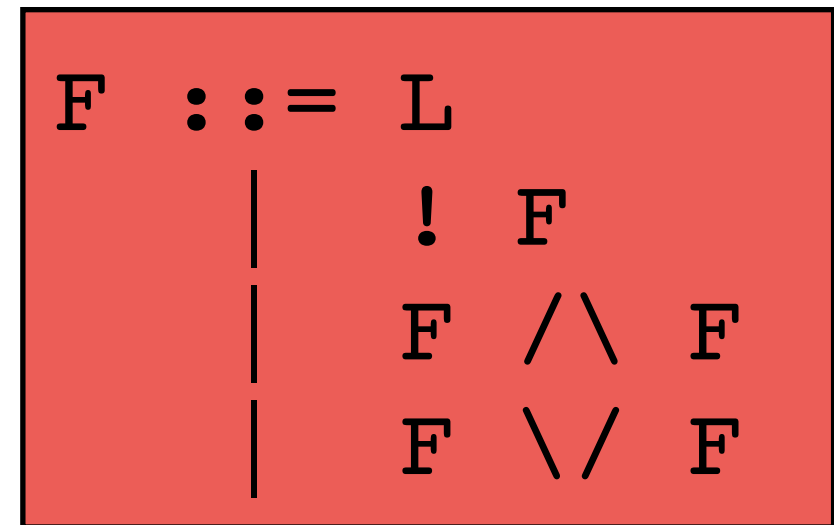
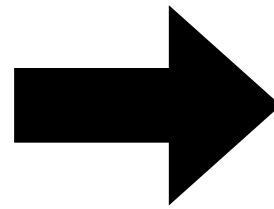
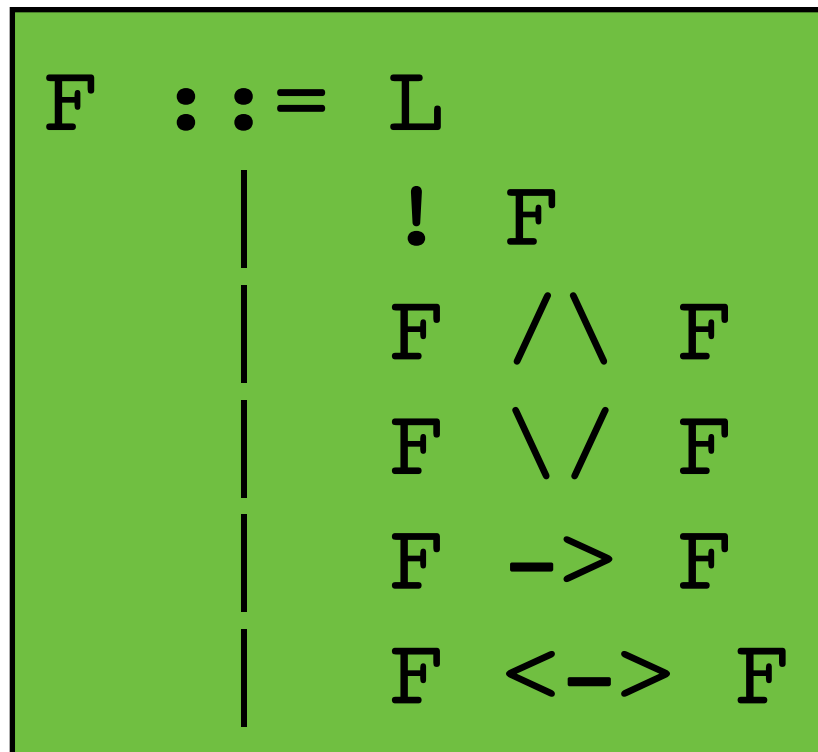





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```

desugar f =
  case f of
  | l => l
  
```

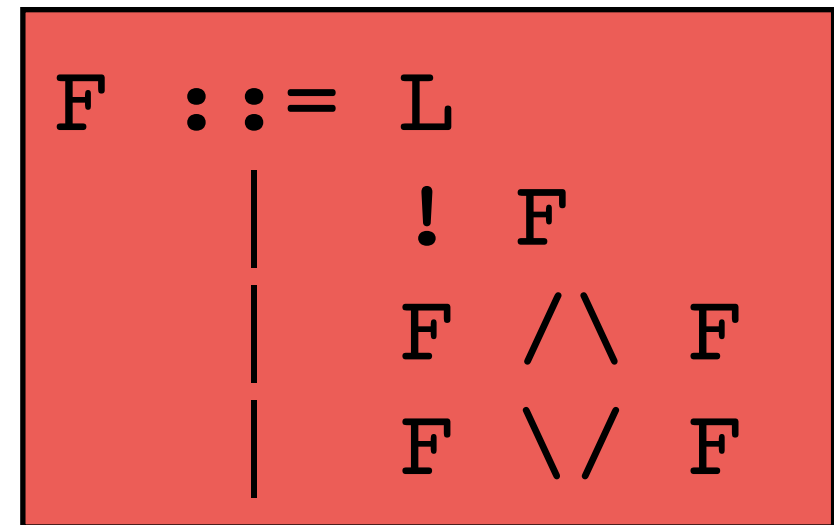
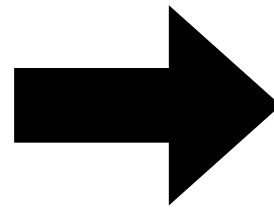
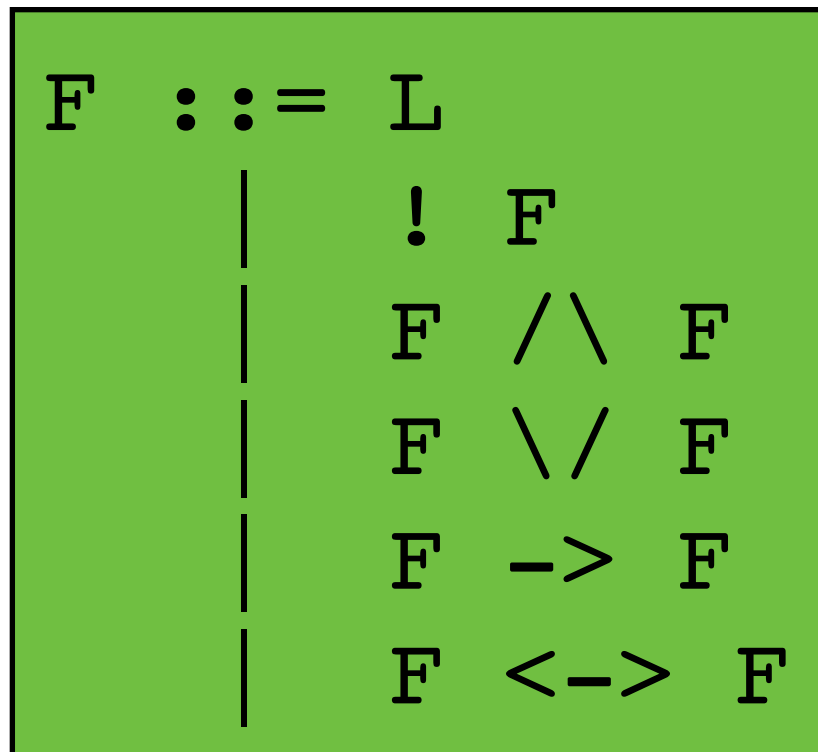



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```

desugar f =
  case f of
  | l => l
  | f1 /\ f2 => (desugar f1) /\ (desugar f2)

```

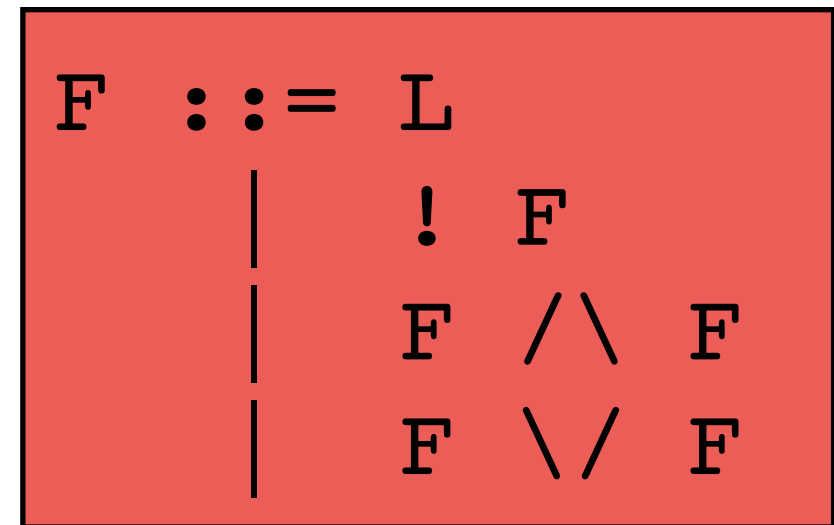
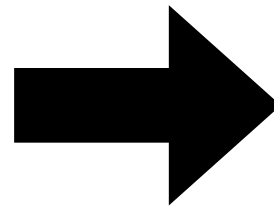
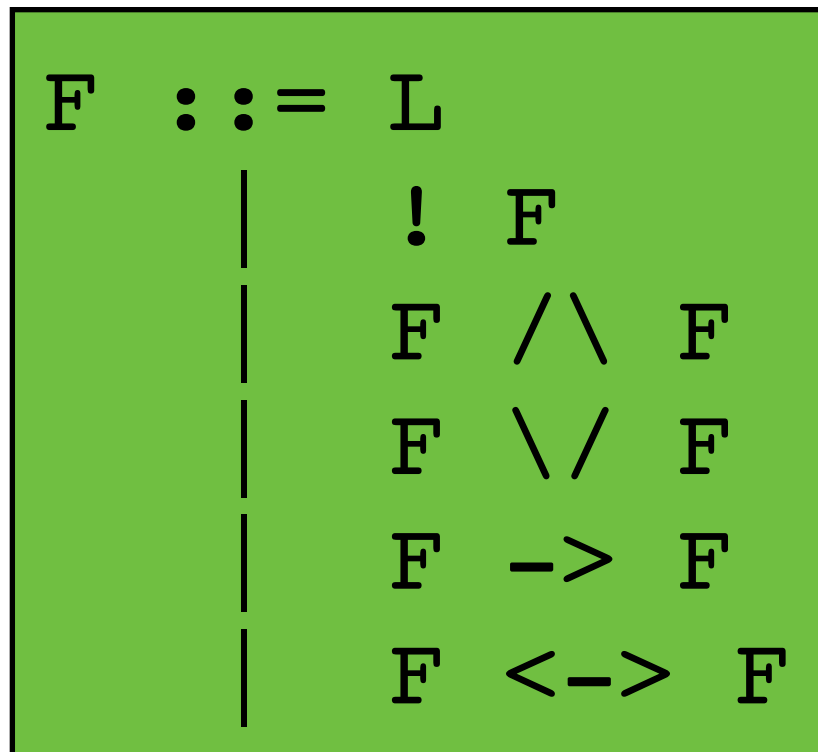



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```

desugar f =
  case f of
  | l => l
  | f1 /\ f2 => (desugar f1) /\ (desugar f2)
  | f1 \/ f2 => (desugar f1) \/ (desugar f2)

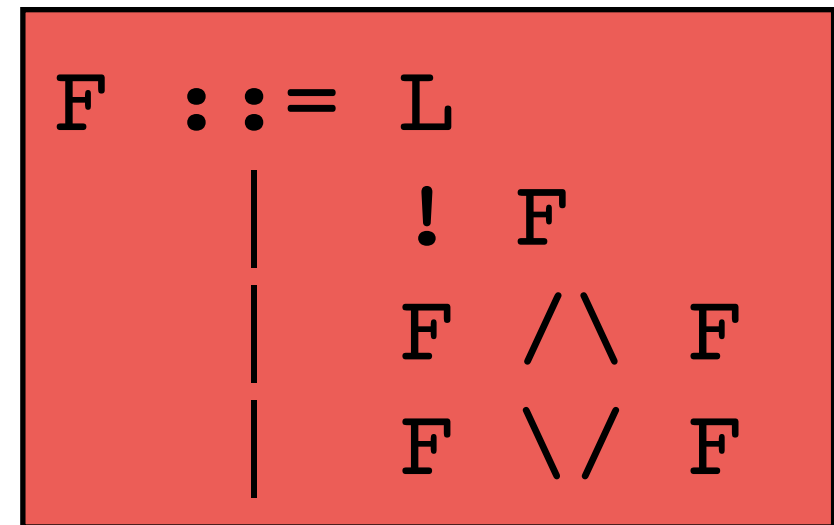
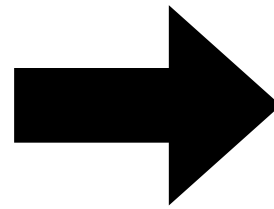
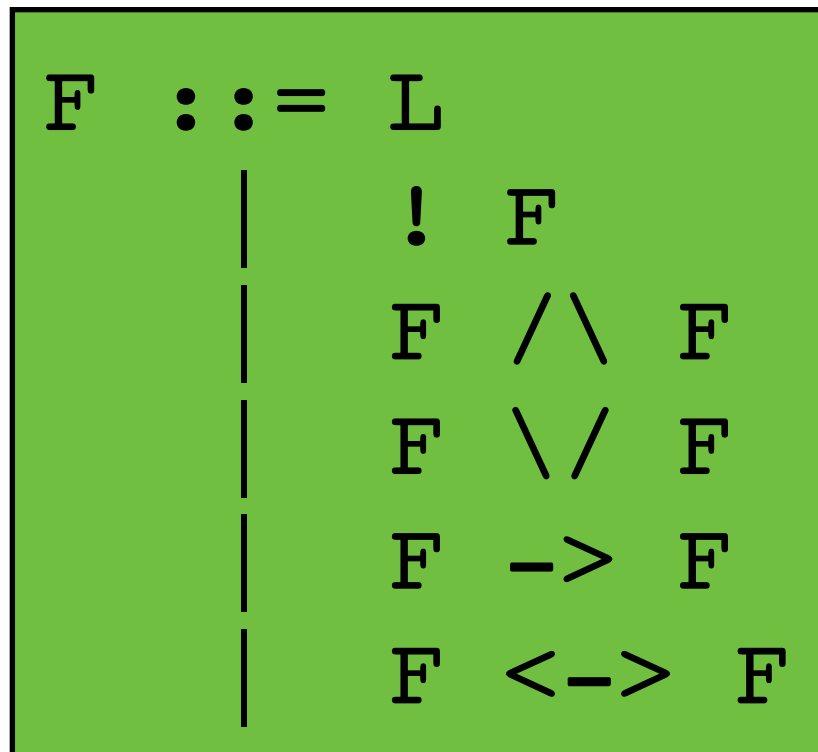
```




---

```

desugar f =
  case f of
  | l => l
  | f1 /\ f2 => (desugar f1) /\ (desugar f2)
  | f1 \/ f2 => (desugar f1) \/ (desugar f2)
  | f1 -> f2 => desugar ((! f1) \/ f2)
  
```

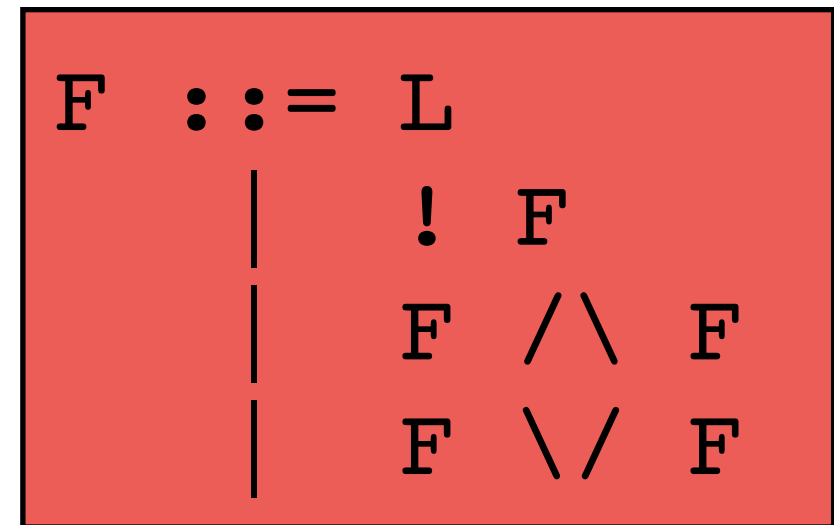
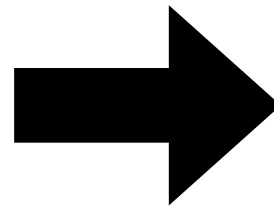
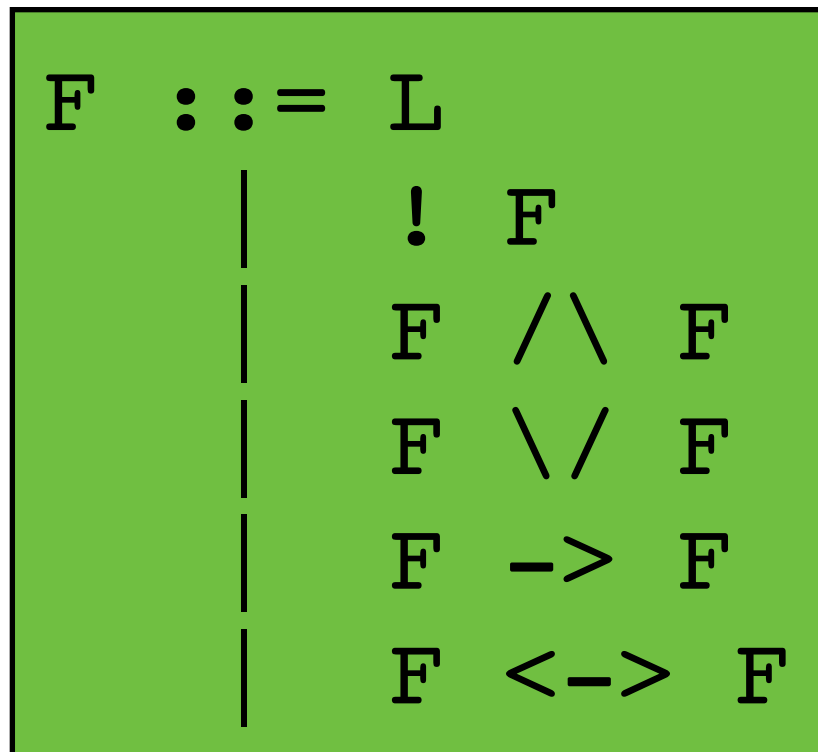



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```

desugar f =
  case f of
  | l => l
  | f1 /\ f2 => (desugar f1) /\ (desugar f2)
  | f1 \/ f2 => (desugar f1) \/ (desugar f2)
  | f1 -> f2 => desugar ((! f1) \/ f2)
  | f1 <-> f2 => desugar ((f1 -> f2) /\ (f2 -> f1))

```



```

desugar f =
case f of

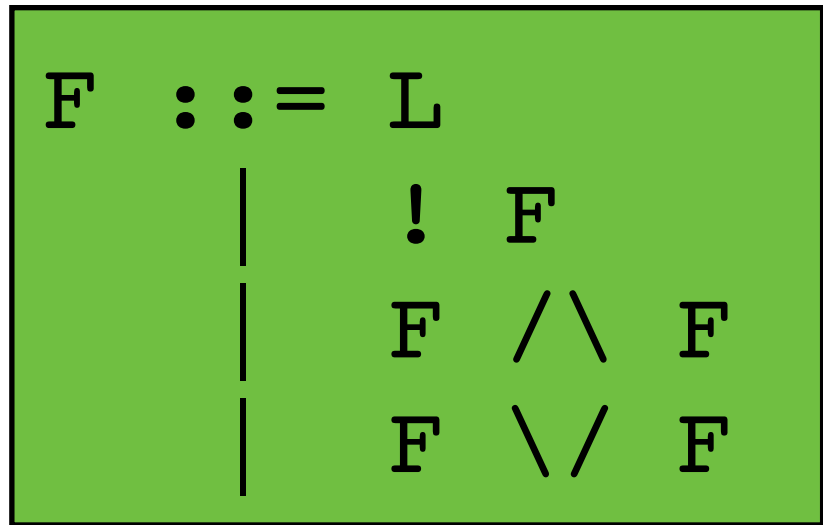
```

Correct? Efficient?

```

| l => l
| f1 /\ f2 => (desugar f1) /\ (desugar f2)
| f1 \/ f2 => (desugar f1) \/ (desugar f2)
| f1 -> f2 => desugar ((! f1) \/ f2)
| f1 <-> f2 => desugar ((f1 -> f2) /\ (f2 -> f1))

```



$F ::= L$

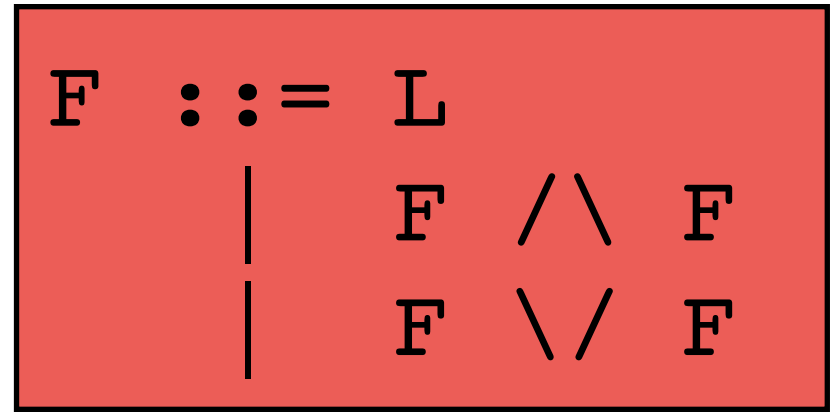
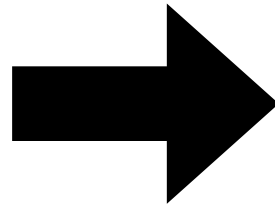
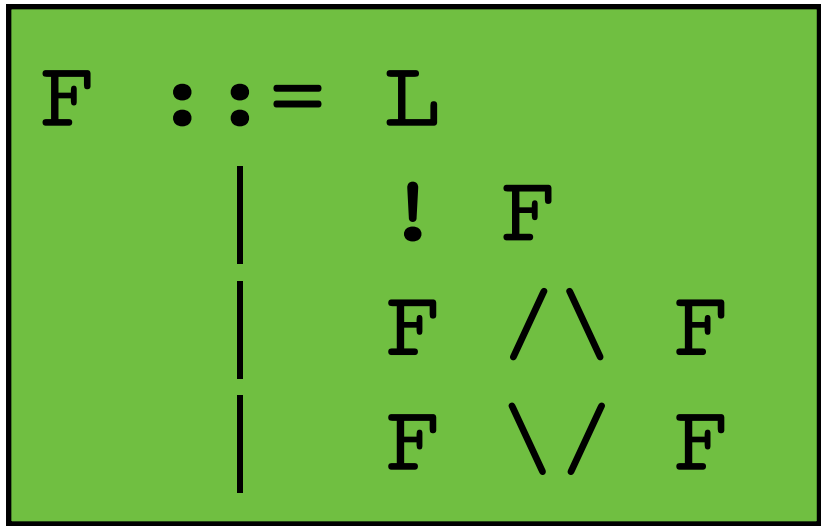
|

! F

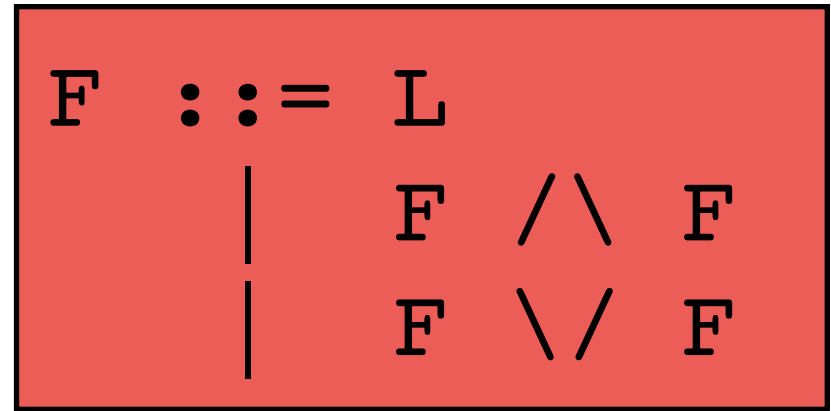
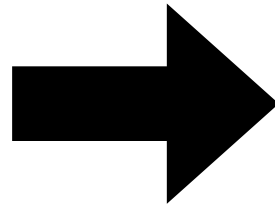
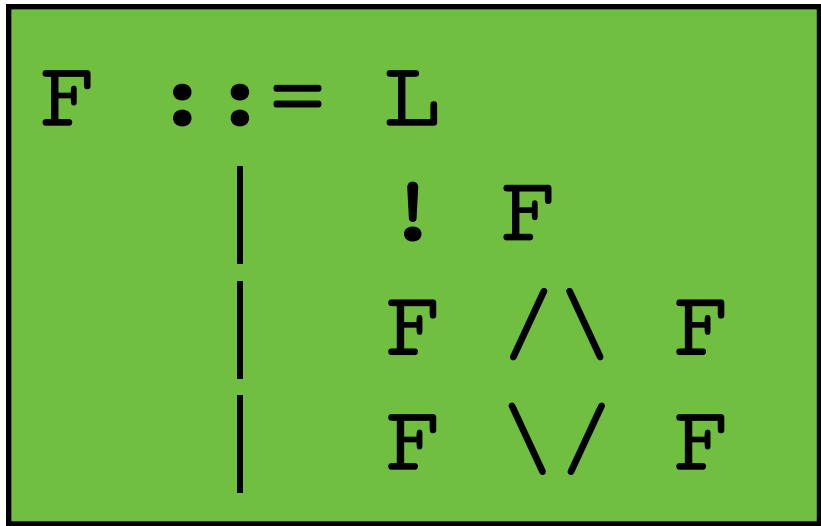
F / \ F

F \ / F





NNF



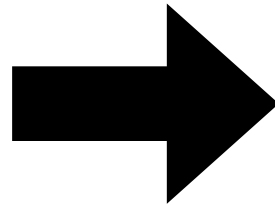
NNF

pnot  $f$  =

```

F ::= L
   | ! F
   | F /\ F
   | F \/ F

```



```

F ::= L
   | F /\ F
   | F \/ F

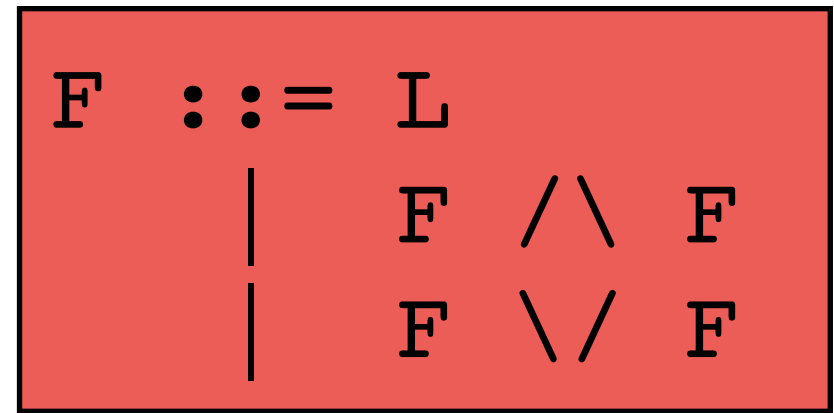
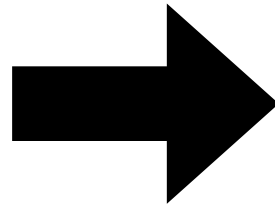
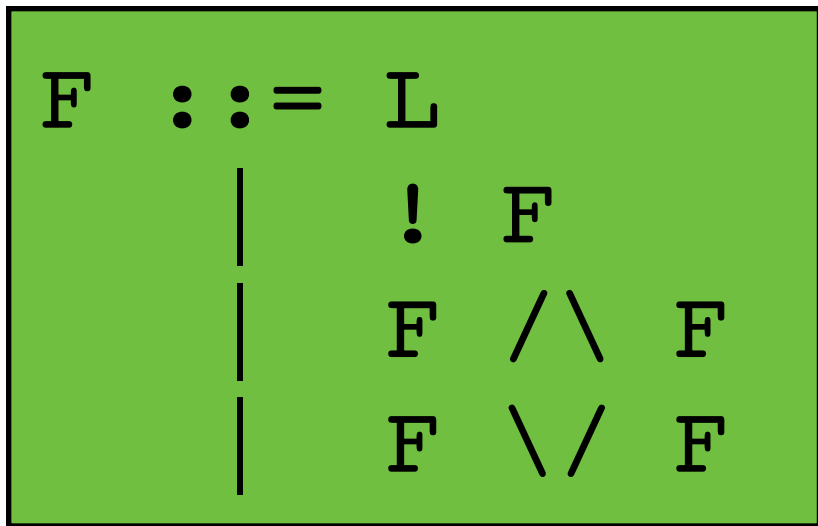
```

NNF

```

pnot f =
  case f of
  | ! (~ a) => a

```



NNF

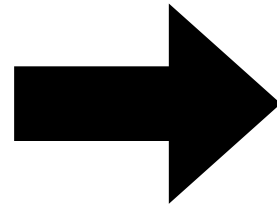
```

pnot f =
  case f of
  | ! (~ a) => a
  | ! a      => ~ a
  
```

```

F ::= L
   | ! F
   | F /\ F
   | F \/ F

```



```

F ::= L
   | F /\ F
   | F \/ F

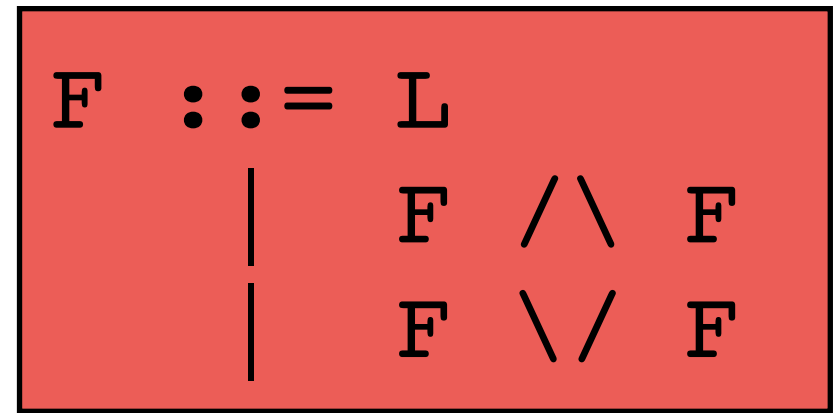
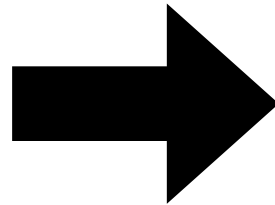
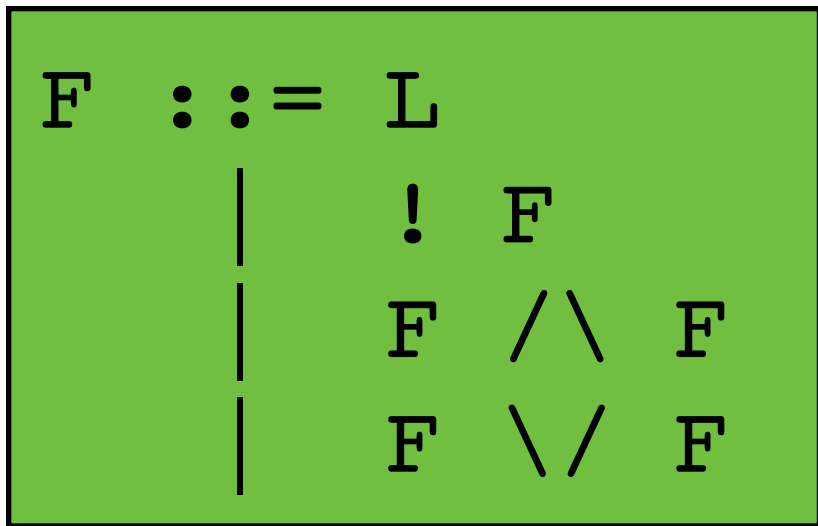
```

NNF

```

pnot f =
  case f of
  | ! (~ a) => a
  | ! a     => ~ a
  | ! ! f   => pnot f

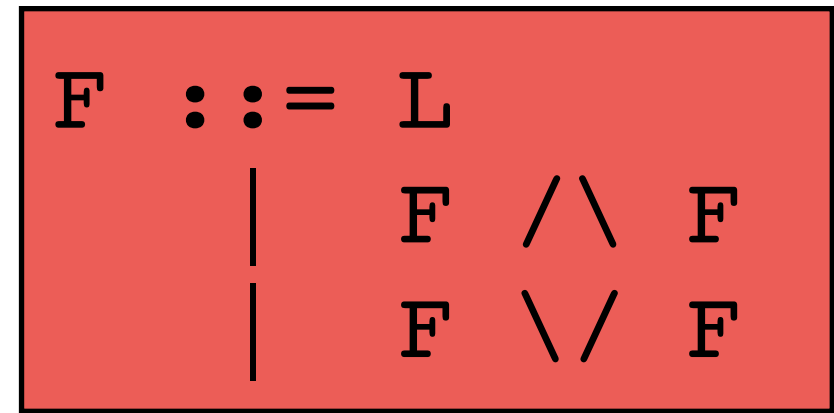
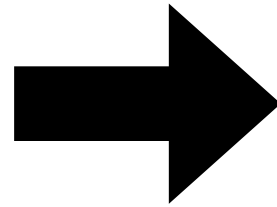
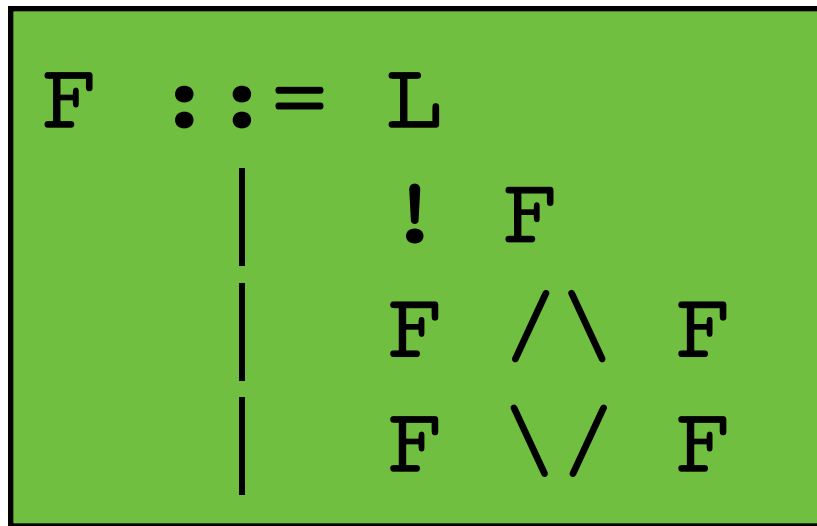
```



NNF

```

pnot f =
  case f of
  | ! (~ a) => a
  | ! a      => ~ a
  | ! ! f    => pnot f
  | ! (f1 /\ f2) => pnot ((! f1) \/ (! f2))
  
```



NNF

`pnot f =`

`case f of`

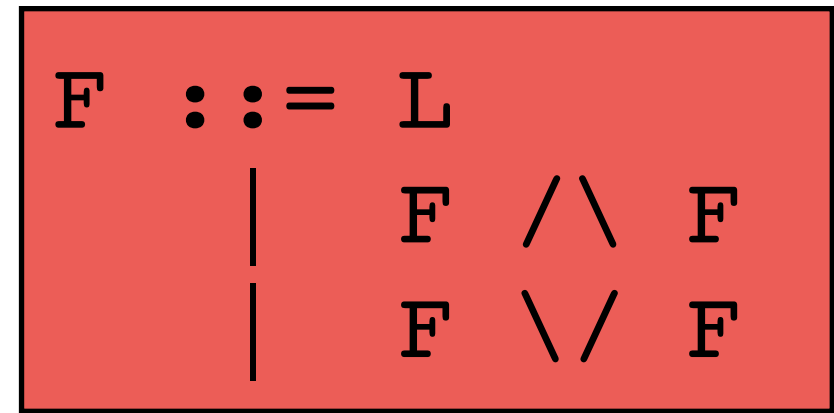
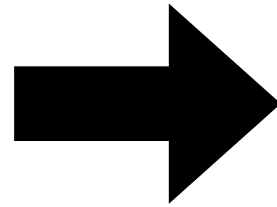
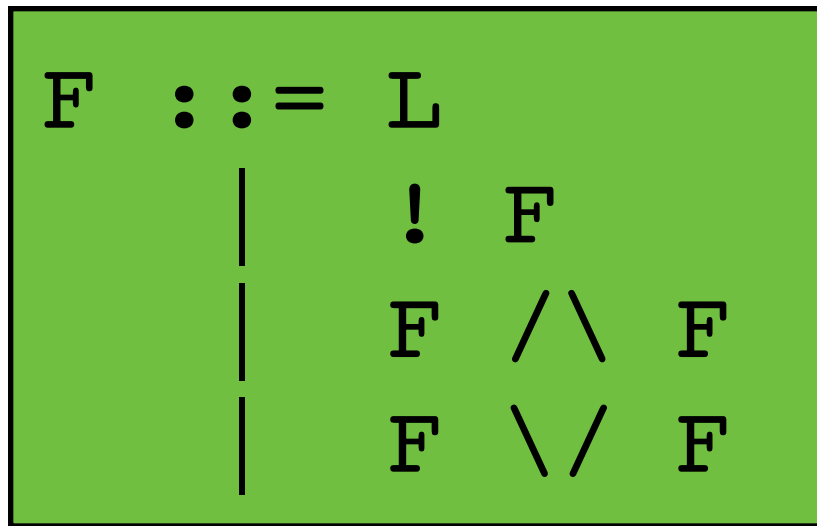
`| ! (~ a) => a`

`| ! a => ~ a`

`| ! ! f => pnot f`

`| ! (f1 /\ f2) => pnot ((! f1) \/ (! f2))`

`| ! (f1 \/ f2) => pnot ((! f1) /\ (! f2))`



NNF

`pnot f =`

`case f of`

`| ! (~ a) => a`

`| ! a => ~ a`

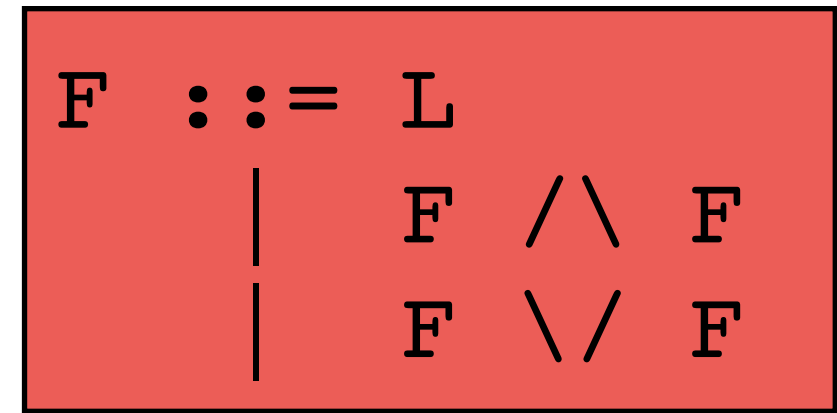
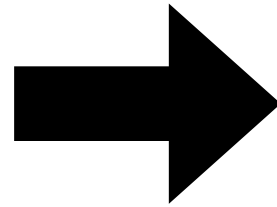
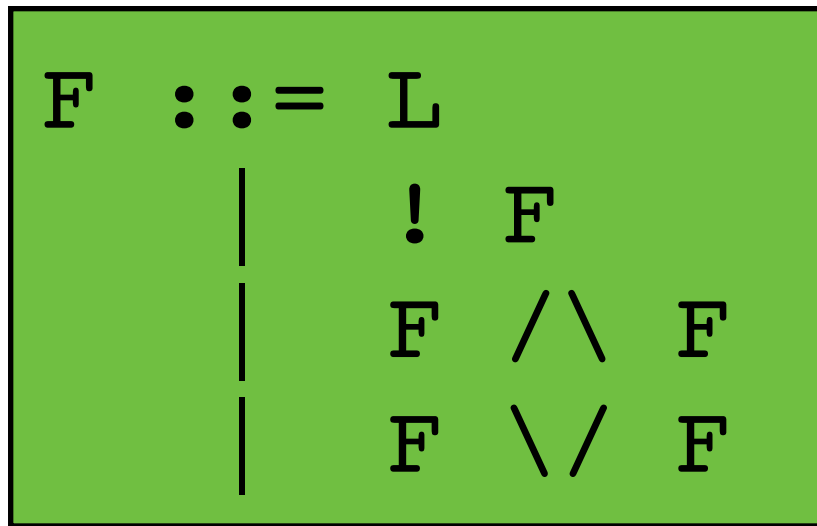
`| ! ! f => pnot f`

`| ! (f1 /\ f2) => pnot ((! f1) \/ (! f2))`

`| ! (f1 \/ f2) => pnot ((! f1) /\ (! f2))`

`| f1 /\ f2 => (pnot f1) \/ (pnot f2)`



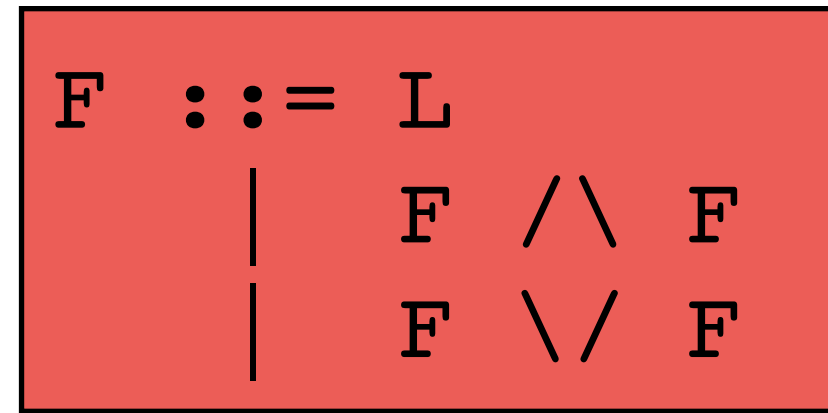
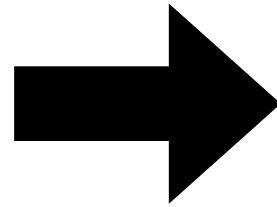
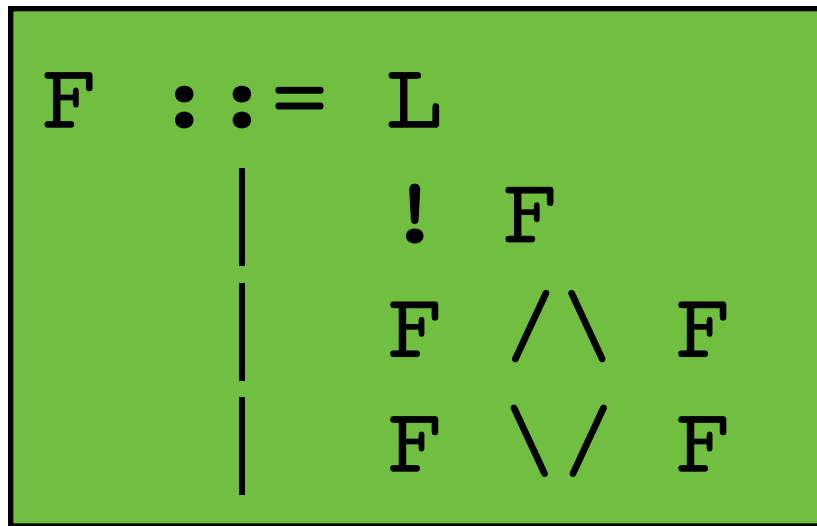


NNF

`pnot f =`

`case f of`

<code>! (~ a)</code>	<code>=&gt;</code>	<code>a</code>
<code>! a</code>	<code>=&gt;</code>	<code>~ a</code>
<code>! ! f</code>	<code>=&gt;</code>	<code>pnot f</code>
<code>! (f1 /\ f2)</code>	<code>=&gt;</code>	<code>pnot ((! f1) \\/ (! f2))</code>
<code>! (f1 \\/ f2)</code>	<code>=&gt;</code>	<code>pnot ((! f1) /\ (! f2))</code>
<code>f1 /\ f2</code>	<code>=&gt;</code>	<code>(pnot f1) /\ (pnot f2)</code>
<code>f1 \\/ f2</code>	<code>=&gt;</code>	<code>(pnot f1) \\/ (pnot f2)</code>



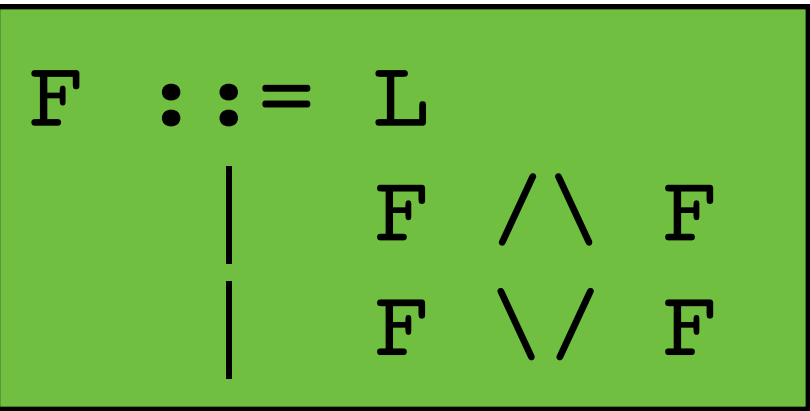
NNF

pnot f =

case f of

- | ! (~ a) => a
- | ! a => ~ a
- | ! ! f => pnot f
- | ! (f1 /\ f2) => pnot ((! f1) \\/ (! f2))
- | ! (f1 \\/ f2) => pnot ((! f1) /\ (! f2))
- | f1 /\ f2 => (pnot f1) /\ (pnot f2)
- | f1 \\/ f2 => (pnot f1) \\/ (pnot f2)

Correct? Efficient?



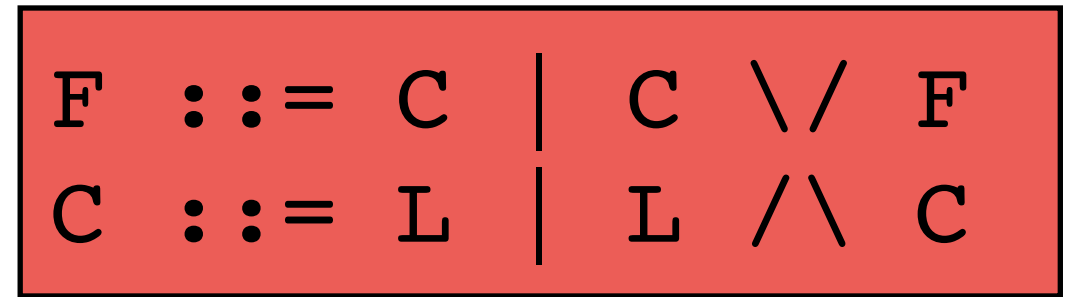
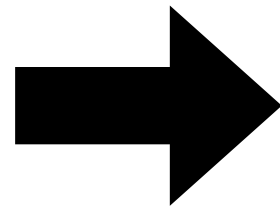
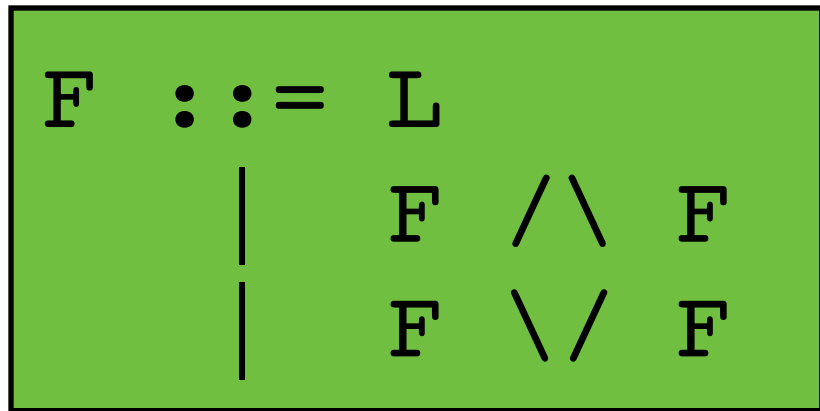
$F ::= L$

|

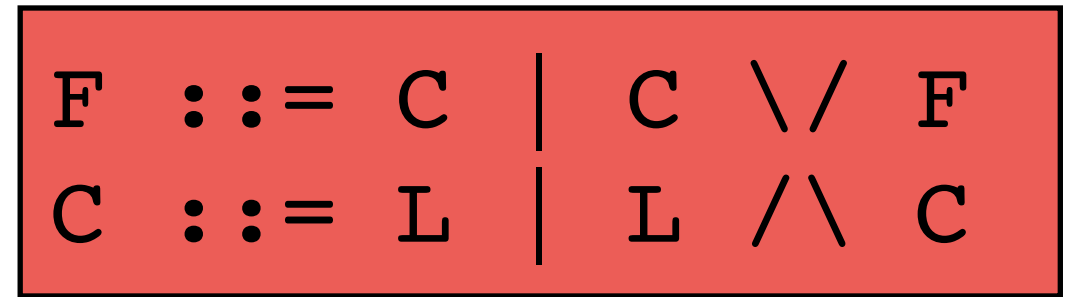
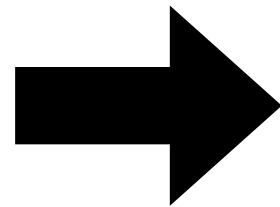
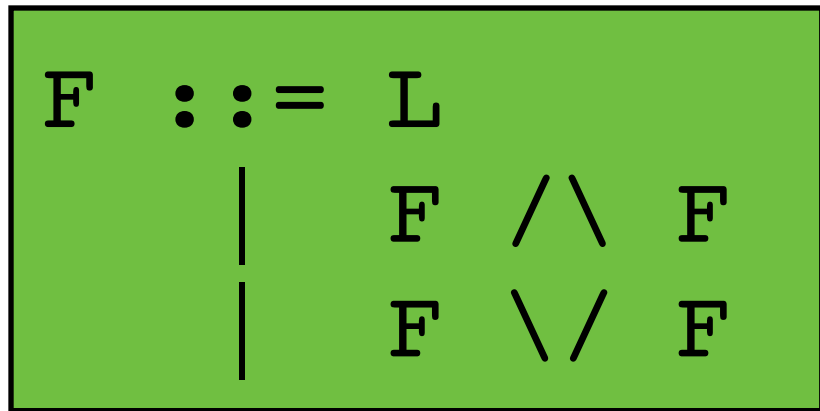
$F \wedge F$

|

$F \vee F$

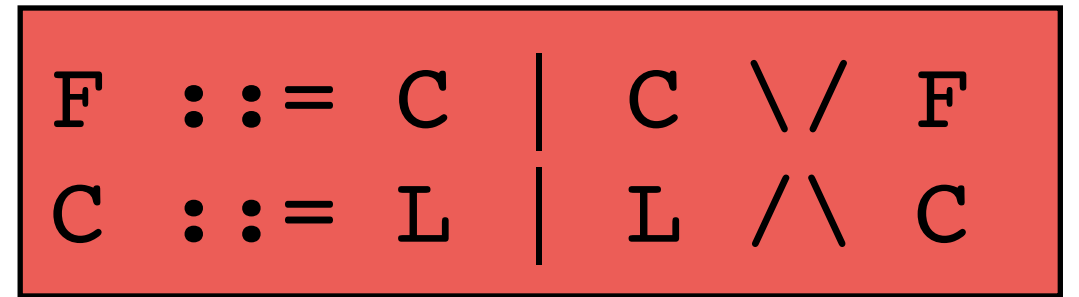
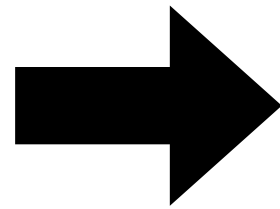
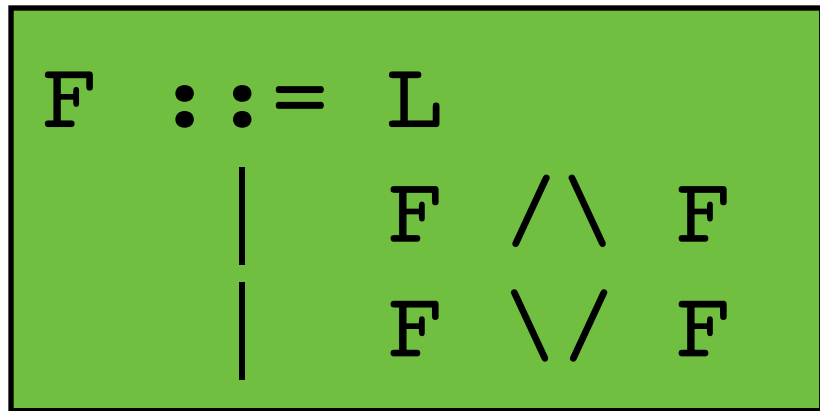


DNF



DNF

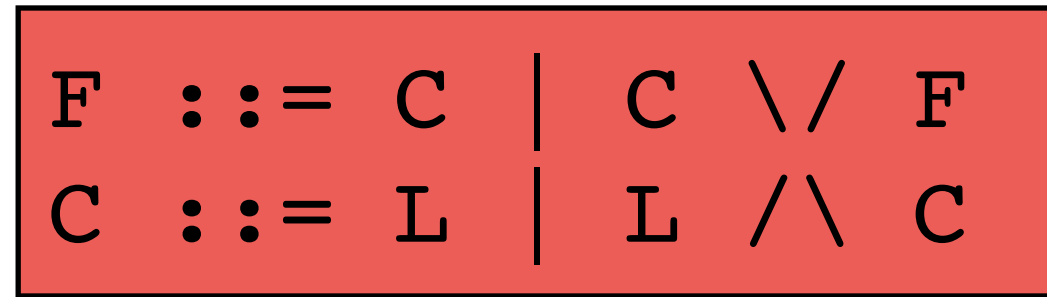
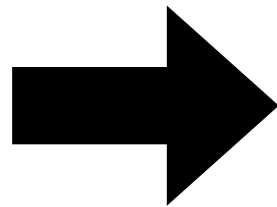
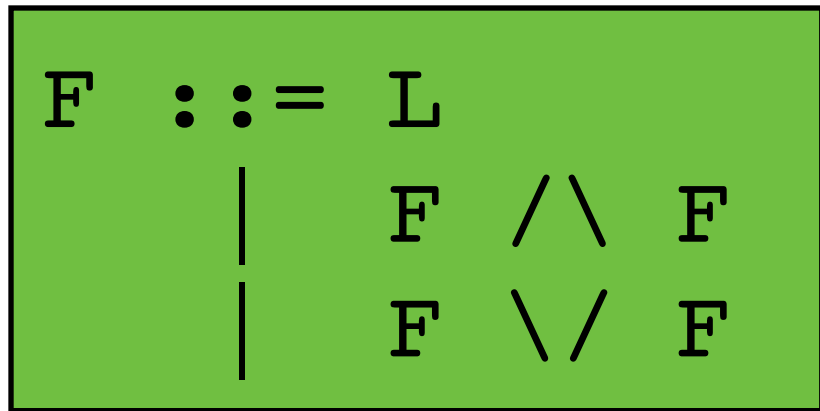
dnf  $f$  =



DNF

```

dnf f =
  case f of
  | 1 => 1
  
```



DNF

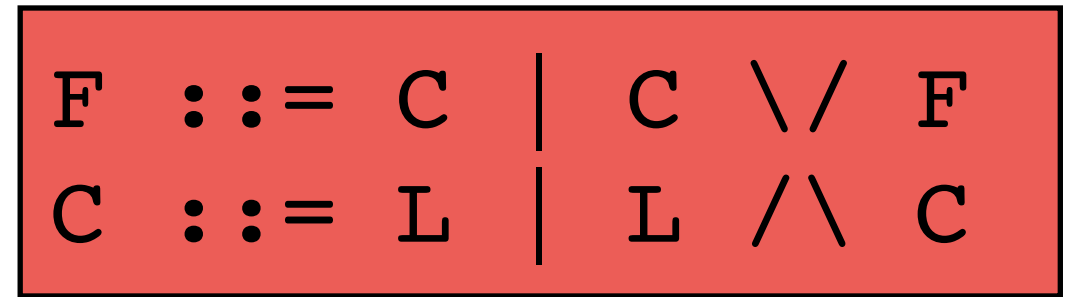
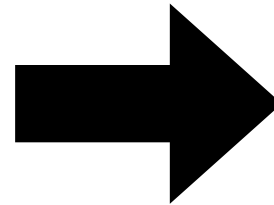
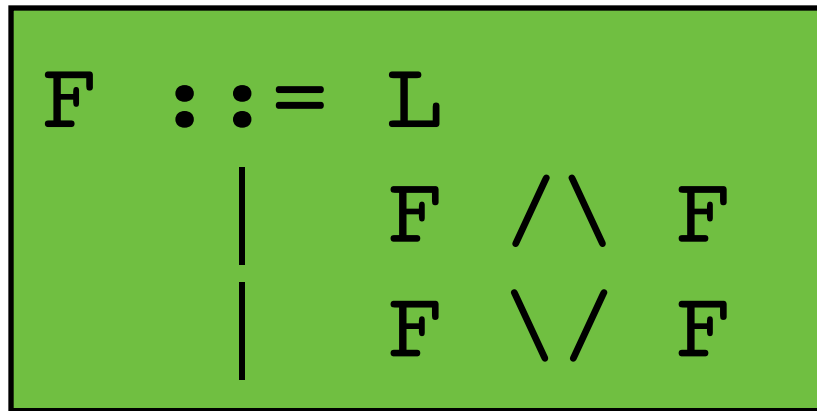
dnf  $f$  =

case  $f$  of

|  $1 \Rightarrow 1$

|  $(f1 \vee f2) \wedge f3 \Rightarrow$  dnf  $((f1 \wedge f3) \vee (f2 \wedge f3))$





DNF

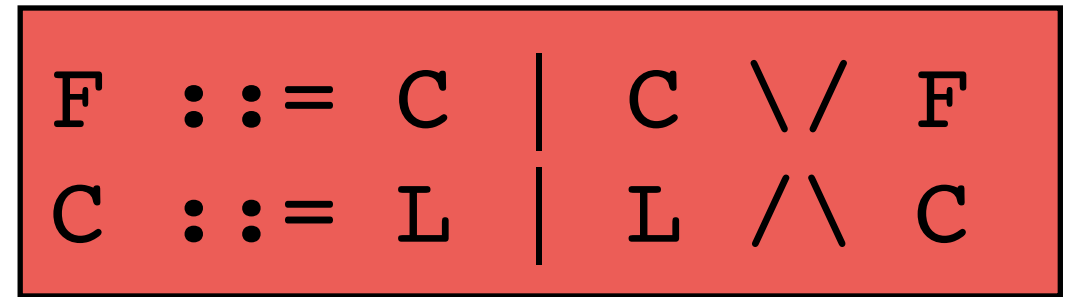
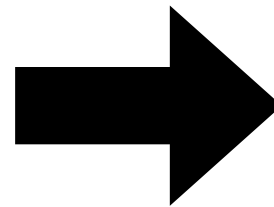
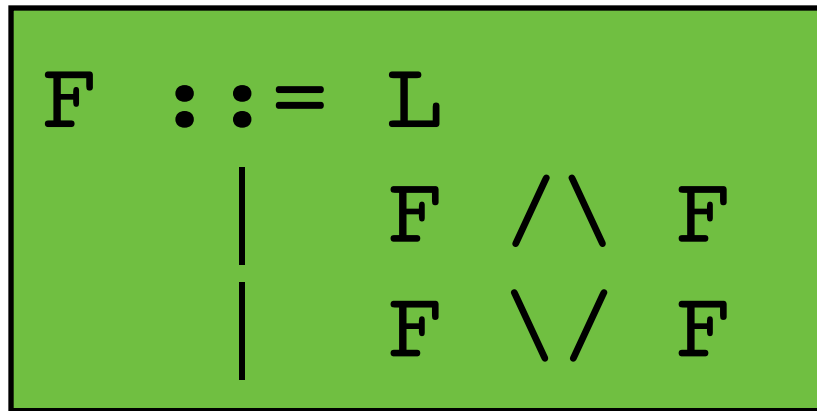
dnf  $f$  =

case  $f$  of

|  $1 \Rightarrow 1$

|  $(f1 \vee f2) \wedge f3 \Rightarrow$  dnf  $((f1 \wedge f3) \vee (f2 \wedge f3))$

|  $f1 \wedge (f2 \vee f3) \Rightarrow$  dnf  $((f1 \wedge f2) \vee (f1 \wedge f3))$



DNF

dnf  $f$  =

case  $f$  of

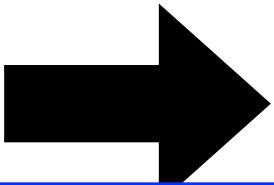
|  $1 \Rightarrow 1$

|  $(f1 \vee f2) \wedge f3 \Rightarrow$  dnf  $((f1 \wedge f3) \vee (f2 \wedge f3))$

|  $f1 \wedge (f2 \vee f3) \Rightarrow$  dnf  $((f1 \wedge f2) \vee (f1 \wedge f3))$

|  $f1 \wedge f2 \Rightarrow$  (dnf  $f1$ )  $\times$  (dnf  $f2$ )

$F ::= L$   
 $| F \wedge F$

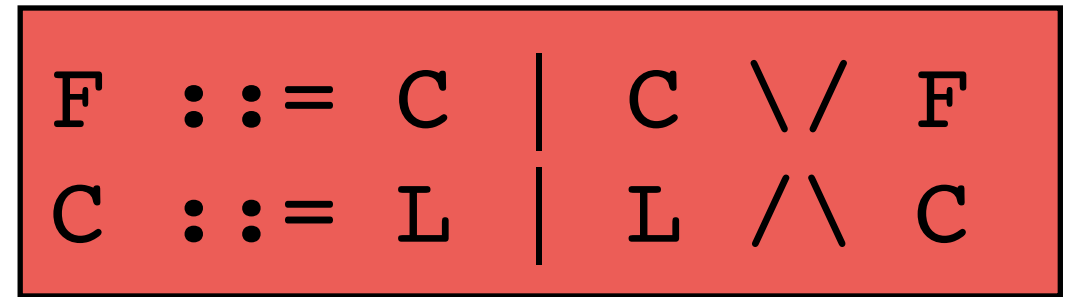
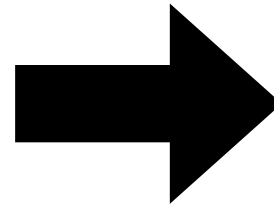
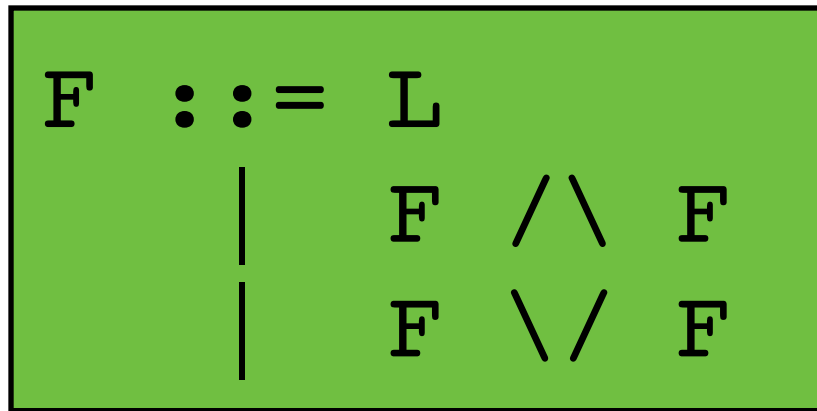


$F ::= C \mid C \vee F$   
 $C ::= L \mid L \wedge C$

$$(a_1 \vee \dots \vee a_k) \times (b_1 \vee \dots \vee b_n) = \\
 (a_1 \wedge b_1) \vee \dots \vee \\
 (a_i \wedge b_j) \vee \dots \vee \\
 (a_k \wedge b_n)$$

dnf

$$\begin{aligned}
 & (f1 \vee f2) \wedge (f2 \vee f3) \\
 & f1 \wedge (f2 \vee f3) \vee (f1 \wedge f2) \wedge (f1 \wedge f3) \\
 & f1 \wedge f2 \Rightarrow (dnf f1) \times (dnf f2)
 \end{aligned}$$



DNF

dnf  $f$  =

case  $f$  of

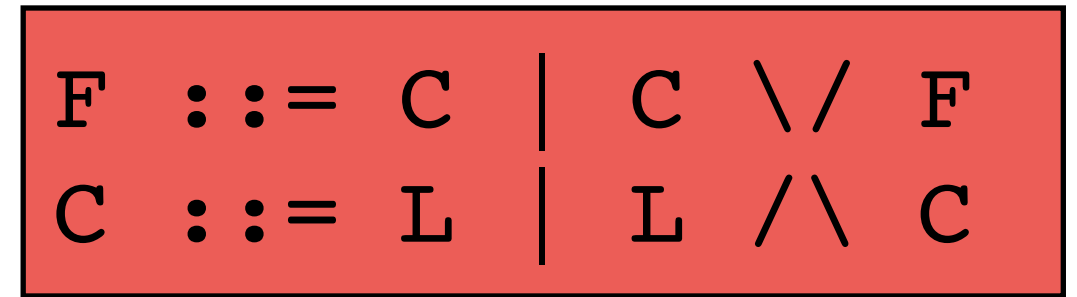
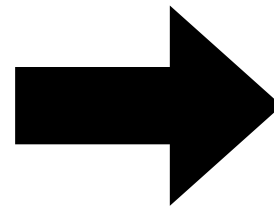
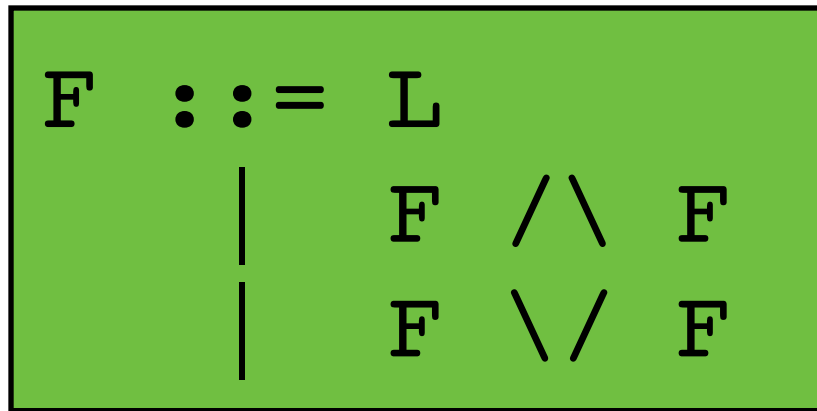
|  $1 \Rightarrow 1$

|  $(f1 \vee f2) \wedge f3 \Rightarrow$  dnf  $((f1 \wedge f3) \vee (f2 \wedge f3))$

|  $f1 \wedge (f2 \vee f3) \Rightarrow$  dnf  $((f1 \wedge f2) \vee (f1 \wedge f3))$

|  $f1 \wedge f2 \Rightarrow$  (dnf  $f1$ )  $\times$  (dnf  $f2$ )

|  $f1 \vee f2 \Rightarrow$  (dnf  $f1$ )  $\vee$  (dnf  $f2$ )



DNF

dnf  $f =$

case  $f$  of

|  $1 \Rightarrow 1$

|  $(f1 \vee f2) \wedge f3 \Rightarrow \text{dnf } ((f1 \wedge f3) \vee (f2 \wedge f3))$

|  $f1 \wedge (f2 \vee f3) \Rightarrow \text{dnf } ((f1 \wedge f2) \vee (f1 \wedge f3))$

|  $f1 \wedge f2 \Rightarrow (\text{dnf } f1) \times (\text{dnf } f2)$

|  $f1 \vee f2 \Rightarrow (\text{dnf } f1) \vee (\text{dnf } f2)$

Correct? Efficient?

$F ::= L$

|

$F \wedge F$

|

$F \vee F$

$F ::= L$

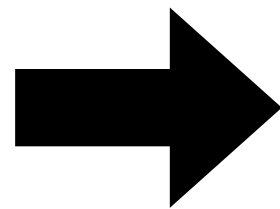
|

$F \wedge F$

|

$F \vee F$

$F ::= L$   
|  $F \wedge F$   
|  $F \vee F$

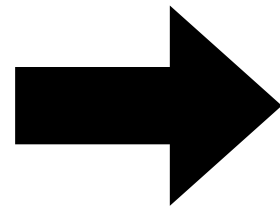


$F ::= D \mid D \wedge C$   
 $D ::= L \mid L \vee D$

CNF



$F$	$::=$	$L$
	$ $	$F \wedge F$
	$ $	$F \vee F$

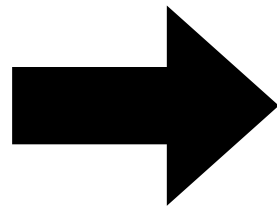


$F$	$::=$	$D$	$ $	$D \wedge C$
$D$	$::=$	$L$	$ $	$L \vee D$

CNF

cnf  $f$  =

F ::= L  
| F /\ F  
| F \/ F



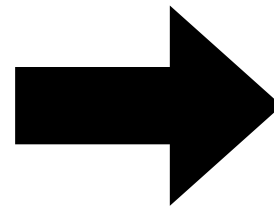
F ::= D | D /\ C  
D ::= L | L \/ D

CNF

---

```
cnf f =  
  case f of  
  | 1 => 1
```

$F$	$::=$	$L$
		$F \wedge F$
		$F \vee F$



$F$	$::=$	$D$		$D$	$\wedge$	$C$
$D$	$::=$	$L$		$L$	$\vee$	$D$

CNF

```
cnf f =
```

```
  case f of
```

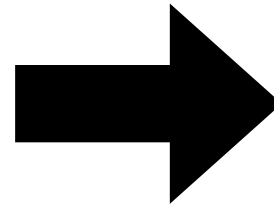
```
  | 1 => 1
```

```
  | (f1 /\ f2) \/ f3 => cnf ((f1 \/ f3) /\ (f2 \/ f3))
```

```

F ::= L
   | F /\ F
   | F \/ F

```



```

F ::= D | D /\ C
D ::= L | L \/ D

```

CNF

```
cnf f =
```

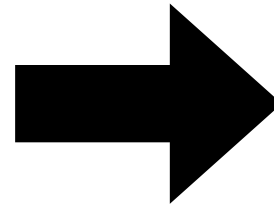
```
case f of
```

```
| 1 => 1
```

```
| (f1 /\ f2) \/ f3 => cnf ((f1 \/ f3) /\ (f2 \/ f3))
```

```
| f1 \/ (f2 /\ f3) => cnf ((f1 \/ f2) /\ (f1 \/ f3))
```

$F$	$::=$	$L$	
		$F \wedge F$	
		$F \vee F$	



$F$	$::=$	$D$		$D \wedge C$
$D$	$::=$	$L$		$L \vee D$

CNF

cnf f =

case f of

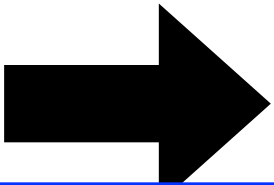
| 1 => 1

| (f1 /\ f2) \/ f3 => cnf ((f1 \/ f3) /\ (f2 \/ f3))

| f1 \/ (f2 /\ f3) => cnf ((f1 \/ f2) /\ (f1 \/ f3))

| f1 \/ f2 => (cnf f1) X (cnf f2)

$F ::= L$   
 $| F \wedge F$



$F ::= D \mid D \wedge C$   
 $D ::= L \mid L \vee D$

$(a_1 \wedge \dots \wedge a_k) \times (b_1 \wedge \dots \wedge b_n) =$   
 $(a_1 \vee b_1) \wedge \dots \wedge$   
 $(a_i \vee b_j) \wedge \dots \wedge$   
 $(a_k \vee b_n)$

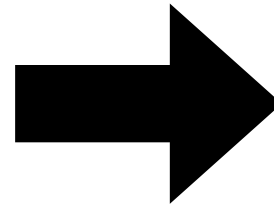
cnf

$(f1 \wedge f2) \wedge (f2 \vee f3) \wedge (f1 \vee f3)$   
 $f1 \vee (f2 \wedge f3) \wedge (f1 \vee f2) \wedge (f1 \vee f3)$   
 $f1 \vee f2 \Rightarrow (cnf f1) \times (cnf f2)$

```

F ::= L
   | F /\ F
   | F \/ F

```



```

F ::= D | D /\ C
D ::= L | L \/ D

```

CNF

```
cnf f =
```

```
case f of
```

```
| 1 => 1
```

```
| (f1 /\ f2) \/ f3 => cnf ((f1 \/ f3) /\ (f2 \/ f3))
```

```
| f1 \/ (f2 /\ f3) => cnf ((f1 \/ f2) /\ (f1 \/ f3))
```

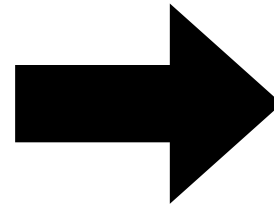
```
| f1 \/ f2 => (cnf f1) X (cnf f2)
```

```
| f1 /\ f2 => (cnf f1) /\ (cnf f2)
```

```

F ::= L
   | F /\ F
   | F \/ F

```



```

F ::= D | D /\ C
D ::= L | L \/ D

```

CNF

Correct? Efficient?

```

cnf f =
case f of
| 1 => 1
| (f1 /\ f2) \/ f3 => cnf ((f1 \/ f3) /\ (f2 \/ f3))
| f1 \/ (f2 /\ f3) => cnf ((f1 \/ f2) /\ (f1 \/ f3))
| f1 \/ f2 => (cnf f1) X (cnf f2)
| f1 /\ f2 => (cnf f1) /\ (cnf f2)

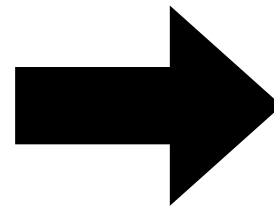
```



```

F ::= L
   | F /\ F
   | F \/ F

```



```

F ::= D | D /\ C
D ::= L | L \/ D

```

CNF

Correct? Efficient?

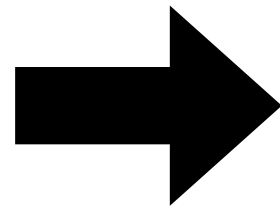
```

cnf f =
case f of
| 1 => 1
| (f1 /\ f2) \/ f3 => cnf ((f1 \/ f3) /\ (f2 \/ f3))
| f1 \/ (f2 /\ f3) => cnf ((f1 \/ f2) /\ (f1 \/ f3))
| f1 \/ f2 => (cnf f1) X (cnf f2)
| f1 /\ f2 => (cnf f1) /\ (cnf f2)

```

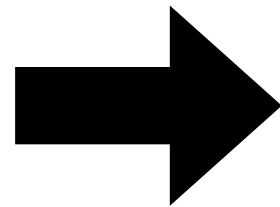


$F ::= L$   
|  $F \wedge F$   
|  $F \vee F$



$F ::= D \mid D \wedge C$   
 $D ::= L \mid L \vee D$

$F ::= L$   
|  $F \wedge F$   
|  $F \vee F$

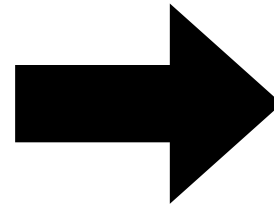


$F ::= D \mid D \wedge C$   
 $D ::= L \mid L \vee D$

---

cnf  $f$  =

$F ::= L$   
|  $F \wedge F$   
|  $F \vee F$

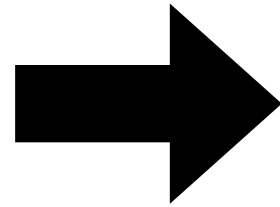


$F ::= D \mid D \wedge C$   
 $D ::= L \mid L \vee D$

---

```
cnf f =  
  case f of  
  | 1 => 1
```

$F ::= L$   
|  $F \wedge F$   
|  $F \vee F$



$F ::= D \mid D \wedge C$   
 $D ::= L \mid L \vee D$

---

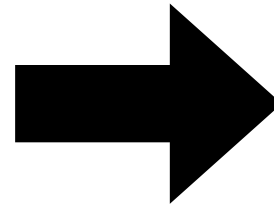
`cnf f =`

`case f of`

`| 1 => 1`

`| f1 /\ f2 => (cnf f1) /\ (cnf f2)`

```
F ::= L
   | F /\ F
   | F \/ F
```

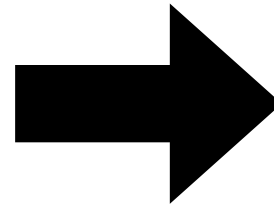


```
F ::= D | D /\ C
D ::= L | L \/ D
```

---

```
cnf f =
  case f of
  | 1 => 1
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)
  | f1 \/ f2 =>
```

$F$	$::=$	$L$
		$F \wedge F$
		$F \vee F$



$F$	$::=$	$D$		$D \wedge C$
$D$	$::=$	$L$		$L \vee D$

```

cnf f =
  case f of
  | 1 => 1
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)
  | f1 \/ f2 =>
      (x1 \/ x2) /\
      (distr_or (~ x1) (cnf f1)) /\
      (distr_or (~ x2) (cnf f2))

```

$F ::= L$



$F ::= D \mid D \wedge C$

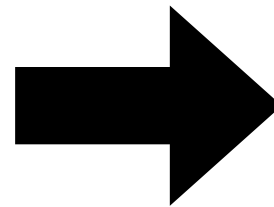
$(\text{distr\_or } (\sim x) ((d_{1,1} \vee \dots \vee d_{1,k}) \wedge \dots \wedge (d_{m,1} \vee \dots \vee d_{m,n}))) =$

$((\sim x \vee d_{1,1} \vee \dots \vee d_{1,k}) \wedge \dots \wedge (\sim x \vee d_{m,1} \vee \dots \vee d_{m,n}))$

$(\text{distr\_or } (\sim x1) (\text{cnf } f1)) \wedge (\text{distr\_or } (\sim x2) (\text{cnf } f2))$



$F$	$::=$	$L$
		$F \wedge F$
		$F \vee F$



$F$	$::=$	$D$		$D \wedge C$
$D$	$::=$	$L$		$L \vee D$

```

cnf f =
  case f of
  | 1 => 1
  | f1 /\ f2 => (cnf f1) /\ (cnf f2)
  | f1 \/ f2 =>
      (x1 \/ x2) /\
      (distr_or (~ x1) (cnf f1)) /\
      (distr_or (~ x2) (cnf f2))

```

# Resolution

$C_a : (a_1 \vee a_2 \vee \dots \vee p \vee \dots \vee a_k)$

$C_b : (b_1 \vee b_2 \vee \dots \vee \sim p \vee \dots \vee b_n)$

---

$(a_1 \vee \dots \vee a_k \vee b_1 \vee \dots \vee b_n)$

# Unit Resolution

$$C_a : p$$

$$C_b : (b_1 \ \backslash / \ b_2 \ \backslash / \ \dots \ \backslash / \ \sim p \ \backslash / \ \dots \ \backslash / \ b_n)$$

---

$$(b_1 \ \backslash / \ \dots \ \backslash / \ b_n)$$

# Unit Resolution

$C_a : p$

$C_b : (b_1 \ \wedge \ b_2 \ \wedge \ \dots \ \wedge \ \sim p \ \wedge \ \dots \ \wedge \ b_n)$

---

$(b_1 \ \wedge \ \dots \ \wedge \ b_n)$

Intuition: modus ponens

$p \ \wedge \ (p \rightarrow b_1 \ \wedge \ \dots \ \wedge \ b_n)$

-----  
 $(b_1 \ \wedge \ \dots \ \wedge \ b_n)$

# Unit Resolution

$$C_a : p$$

$$C_b : (b_1 \ \wedge \ b_2 \ \wedge \ \dots \ \wedge \ \sim p \ \wedge \ \dots \ \wedge \ b_n)$$

---

$$(b_1 \ \wedge \ \dots \ \wedge \ b_n)$$

## Boolean Constraint Propagation

# Unit Resolution

$C_a : p$

$C_b : (b_1 \vee b_2 \vee \dots \vee \sim p \vee \dots \vee b_n)$

---

$(b_1 \vee \dots \vee b_n)$

# Boolean Constraint Propagation

`bcp f =`

`case pick_unit_clause f of`

`| x => bcp (f[x ↦ ⊤])`

`| NONE => f`

# Davis Putnam Logemann Loveland

```
dp11 f =  
  f' = bcp f  
  case f' of  
  |  $\top$  => SAT  
  |  $\perp$  => UNSAT  
  | _ =>  
    x = pick_var f'  
    if dp11 f' [x  $\mapsto$   $\top$ ] = SAT then  
      SAT  
    else  
      dp11 (f' [x  $\mapsto$   $\perp$ ])
```

# Pure Literal Propagation

If a literal only occurs  
positively,  $\top$

If a literal only occurs  
negatively,  $\perp$



# DPLL + PLP

```
dp11 f =
  f' = plp (bcp f)
  case f' of
  |  $\top$  => SAT
  |  $\perp$  => UNSAT
  | _ =>
    x = pick_var f'
    if dp11 f' [x  $\mapsto$   $\top$ ] = SAT then
      SAT
    else
      dp11 (f' [x  $\mapsto$   $\perp$ ])
```